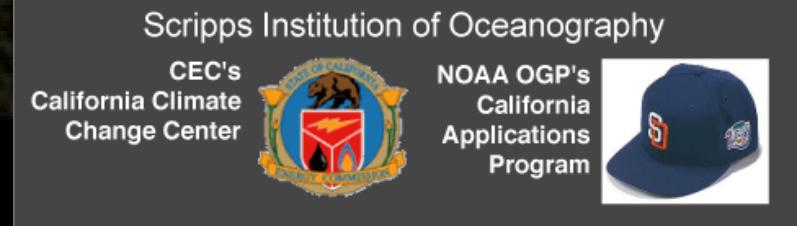
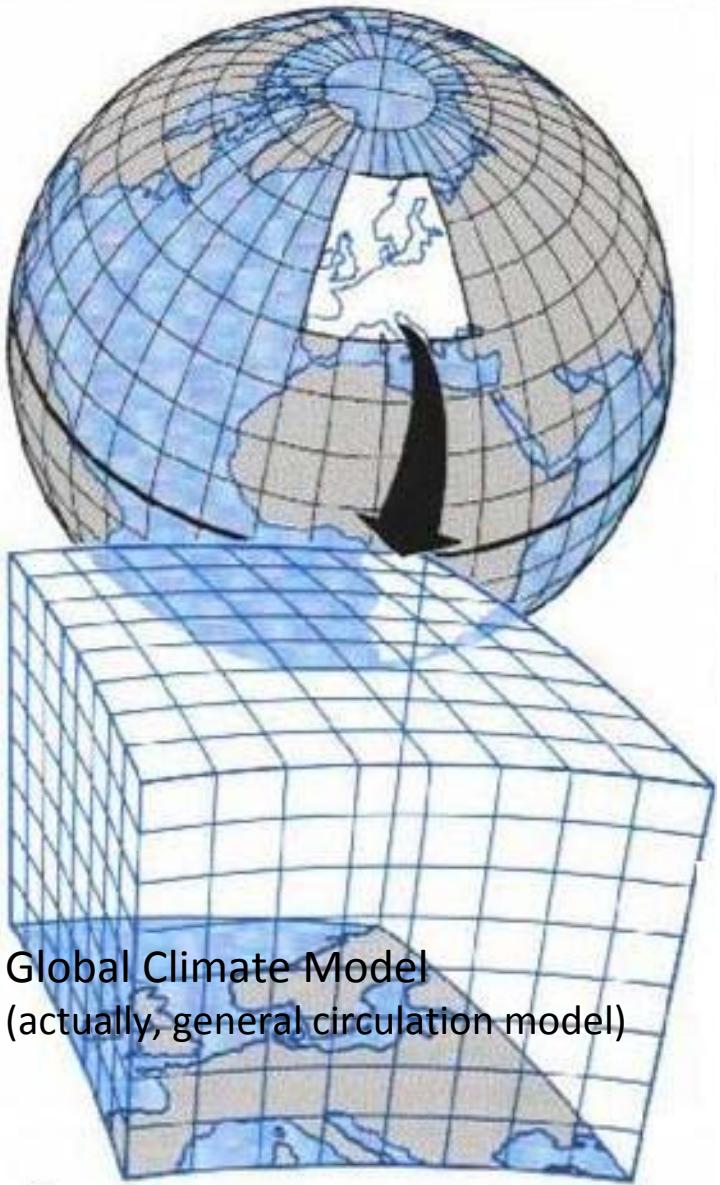


Statistical Downscaling for the State of California

*Mike Dettinger & Dan Cayan
US Geological Survey, La Jolla, CA*

*CDFG/USGS/USFWS Downscaling Workshop,
CSU Sacramento, Nov 3, 2010*



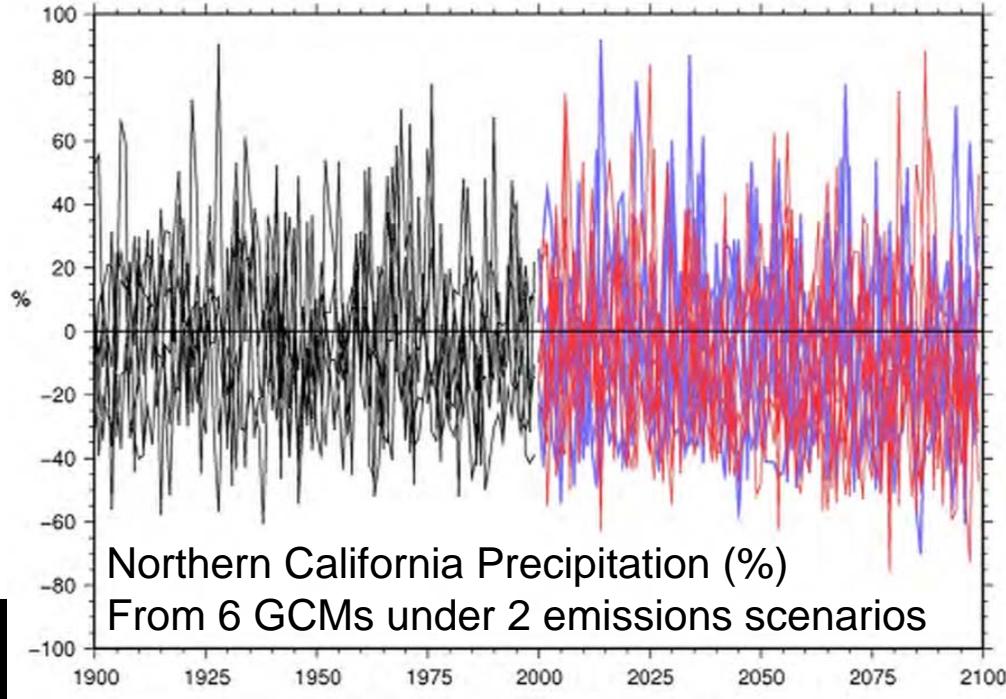
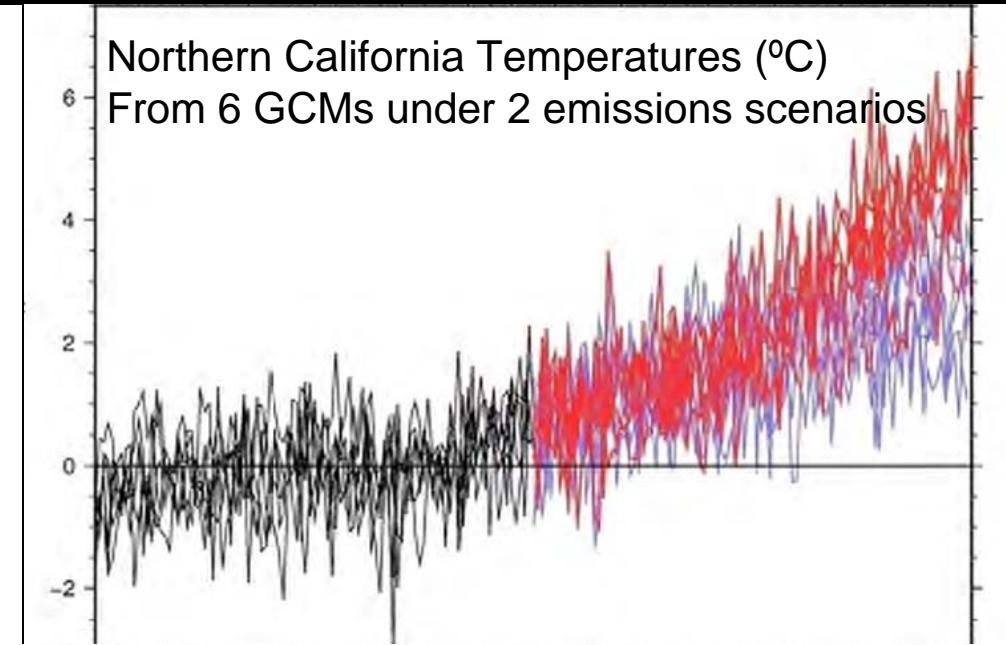


Global Climate Model
(actually, general circulation model)



Cayan et al 2009

Northern California Temperatures ($^{\circ}\text{C}$)
From 6 GCMs under 2 emissions scenarios

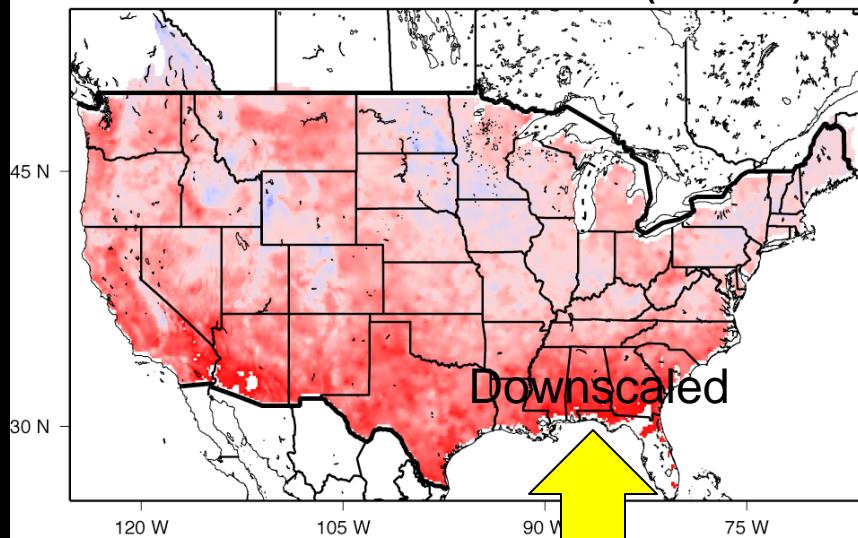


Northern California Precipitation (%)
From 6 GCMs under 2 emissions scenarios

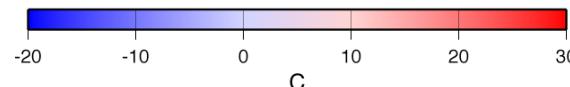
THE DOWNSCALING PROBLEM:

One day in the 21st Century...

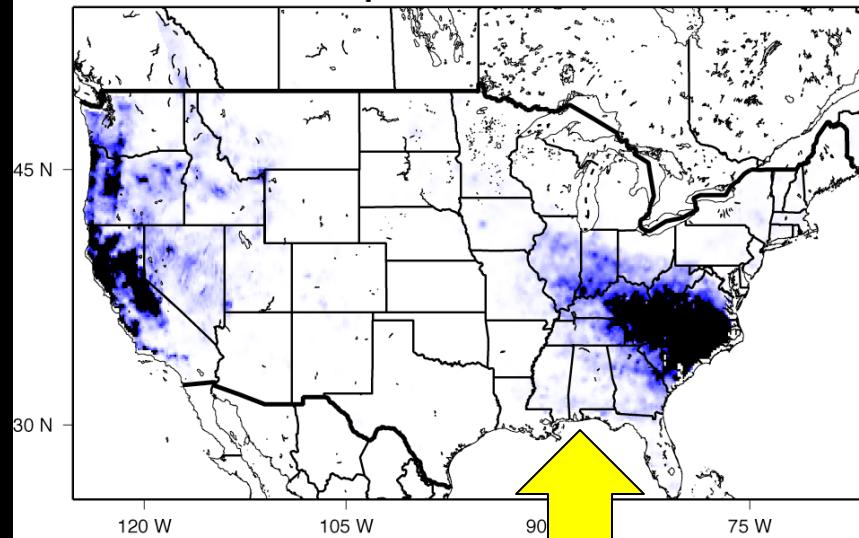
Tmax on Mar 14 2050(GFDL A2)



Downscaled
Original GCM
values



Precip on Mar 14 2050



Downscaling options:

Statistical

- δT and %P rescaling
- Synthetic statistical
- Deterministic statistical

Dynamical simulation

dT and %P re-scalings

ADD projected mean temperature changes to a historical record

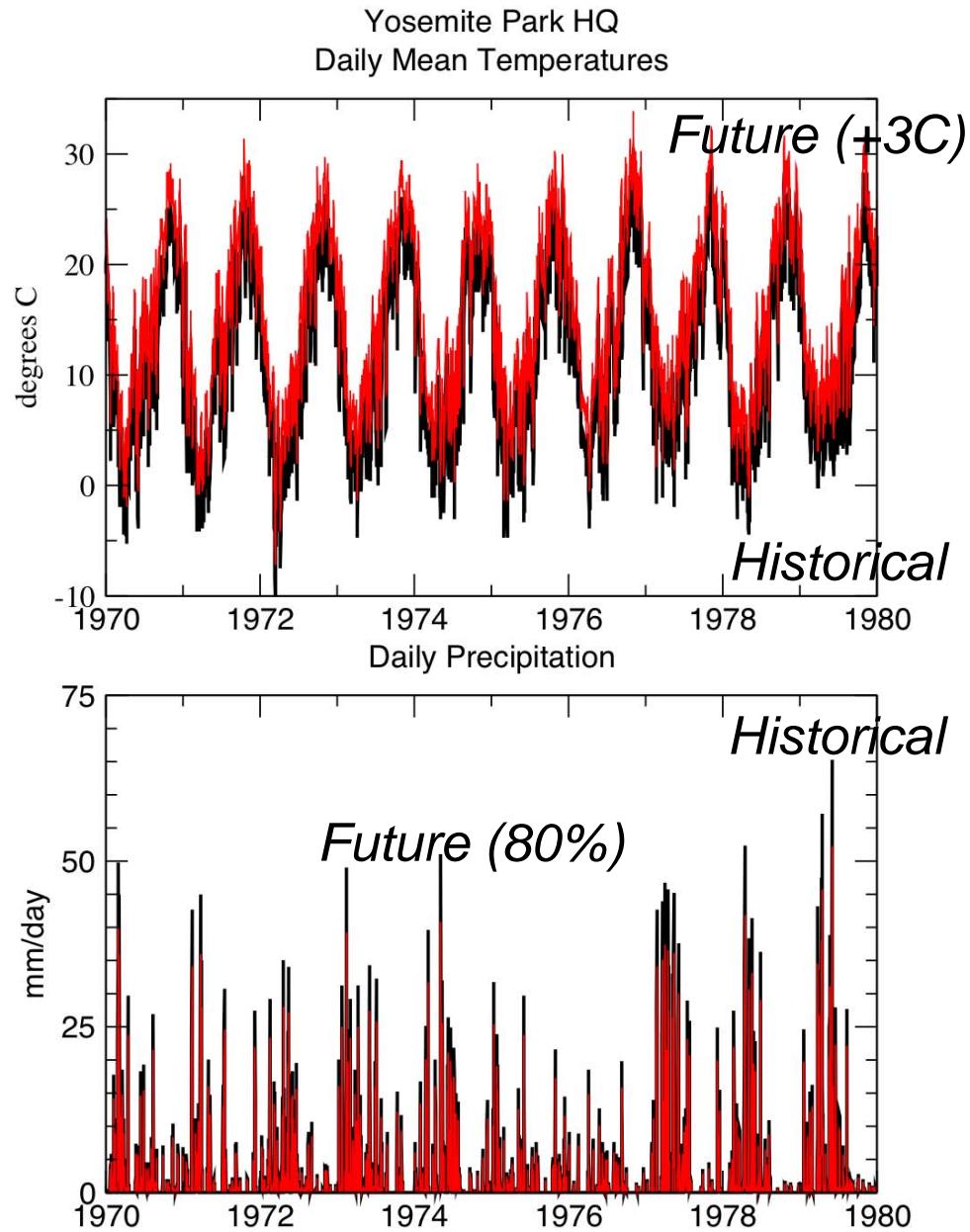
Multiply historical record by projected mean precipitation (as fraction of historical)



Easy, maintains realistic variability, know exactly what changed



No new variability or extremes, not realistic, minimal use of GCM



Synthetic statistical scenarios

$$\text{Prob}(O_i) = \alpha_o + \alpha_{oi-1} O_{i-1} + \alpha_{sh} SH_i + \alpha_u U_i + \alpha_h H_i$$

$$R_i = \exp(\beta + \beta_{sh} SH_i + \beta_u U_i + \beta_h H_i + \varepsilon)$$

$$TMAX_i = \delta_0 + \delta_{TMAXi-1} TMAX_{i-1} + \delta_{SH} SH_i + \delta_U U_i + \delta_h H_i + \zeta_i$$

$$TMIN_i = \gamma_0 + \gamma_{TMINi-1} TMIN_{i-1} + \gamma_{SH} SH_i + \gamma_u U_i + \gamma_h H_i + \xi_i$$

With O = occurrence of precipitation

SH = humidity

U = wind speed

H = geopotential height

R = wet-day precipitation amount

$TMAX$ and $TMIN$ = daily maximum & minimum
temperatures

e.g., Wilby et al., 2001

Synthetic statistical scenarios

$$\text{Prob}(O_i) = \alpha_o + \alpha_{oi-1} O_{i-1} + \alpha_{sh} SH_i + \alpha_u U_i + \alpha_h H_i$$

$$R_i = \exp(\beta + \beta_{sh} SH_i + \beta_u U_i + \beta_h H_i + \varepsilon)$$

$$\text{TMAX}_i = \delta_0 + \delta_{\text{TMAX}_{i-1}} \text{TMAX}_{i-1} + \delta_{SH} SH_i + \delta_U U_i + \delta_h H_i + \zeta_i$$

$$\text{TMIN}_i = \gamma_0 + \gamma_{\text{TMIN}_{i-1}} \text{TMIN}_{i-1} + \gamma_{SH} SH_i + \gamma_u U_i + \gamma_h H_i + \xi_i$$

With O = occurrence of precipitation

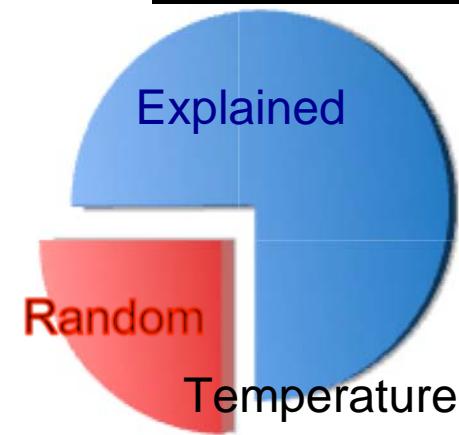
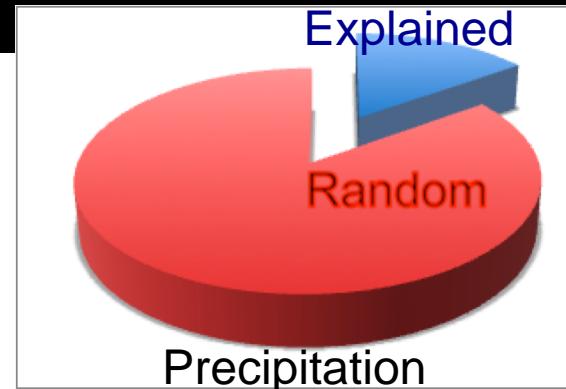
SH = humidity

U = wind speed

H = geopotential height

R = wet-day precipitation amount

TMAX and TMIN = daily maximum & minimum temperatures



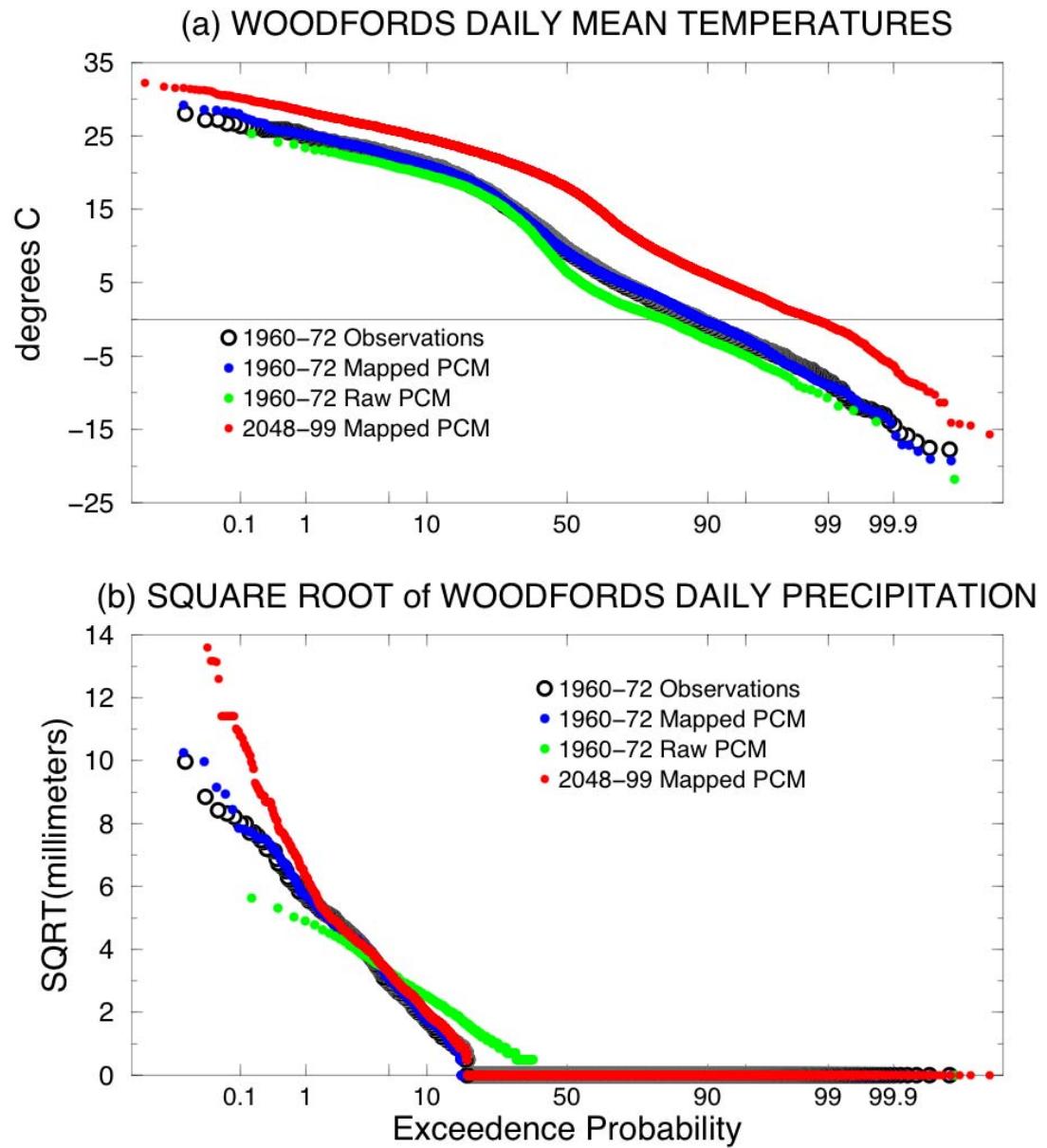
e.g., Wilby et al., 2001

Deterministic statistical

Local bias-correction example

(Dettinger et al, 2004 *Clim Chg*)

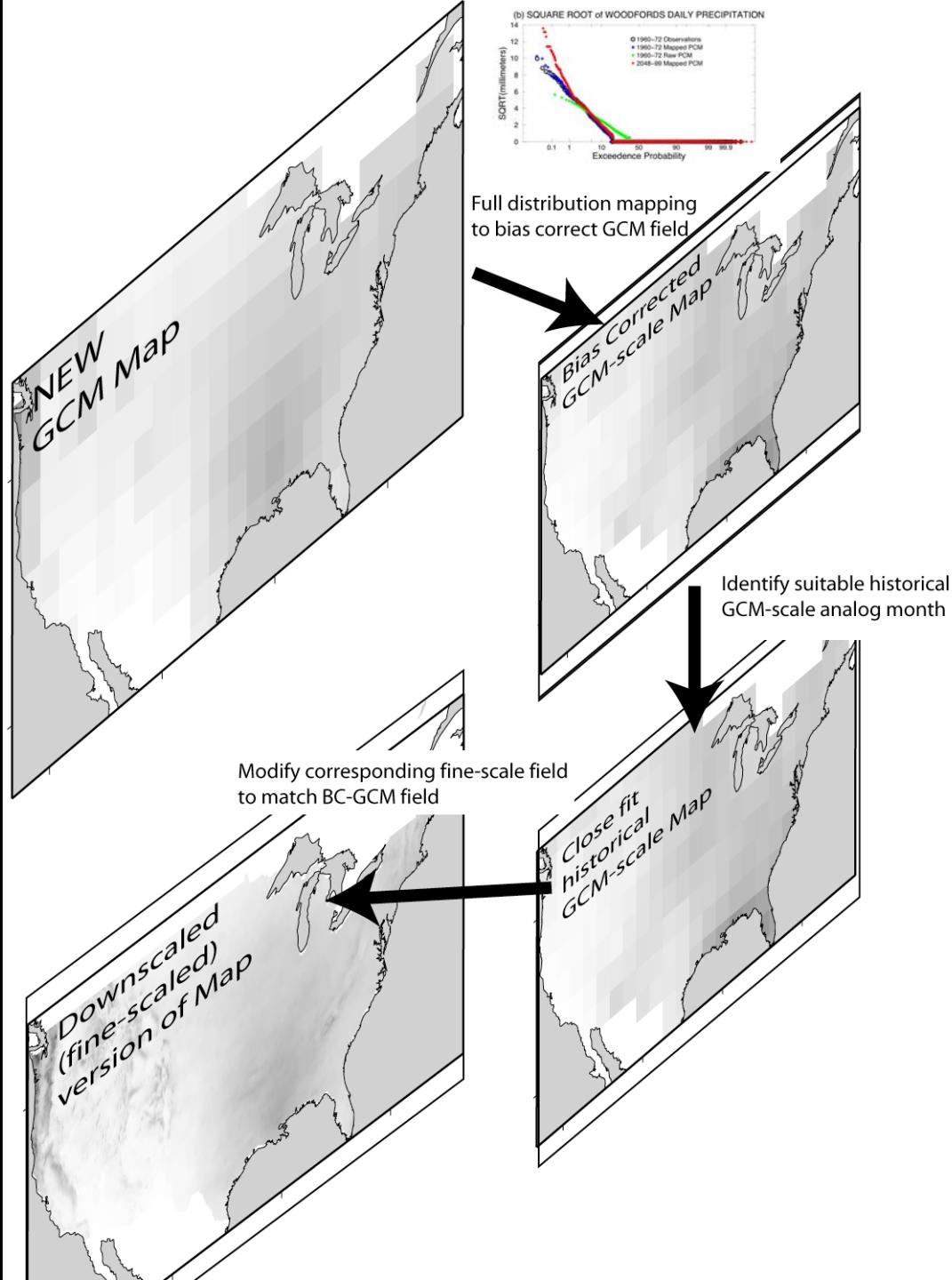
Map GCM variables into historical distribution of variables, maintaining ranks from GCM but absolute values from historical records



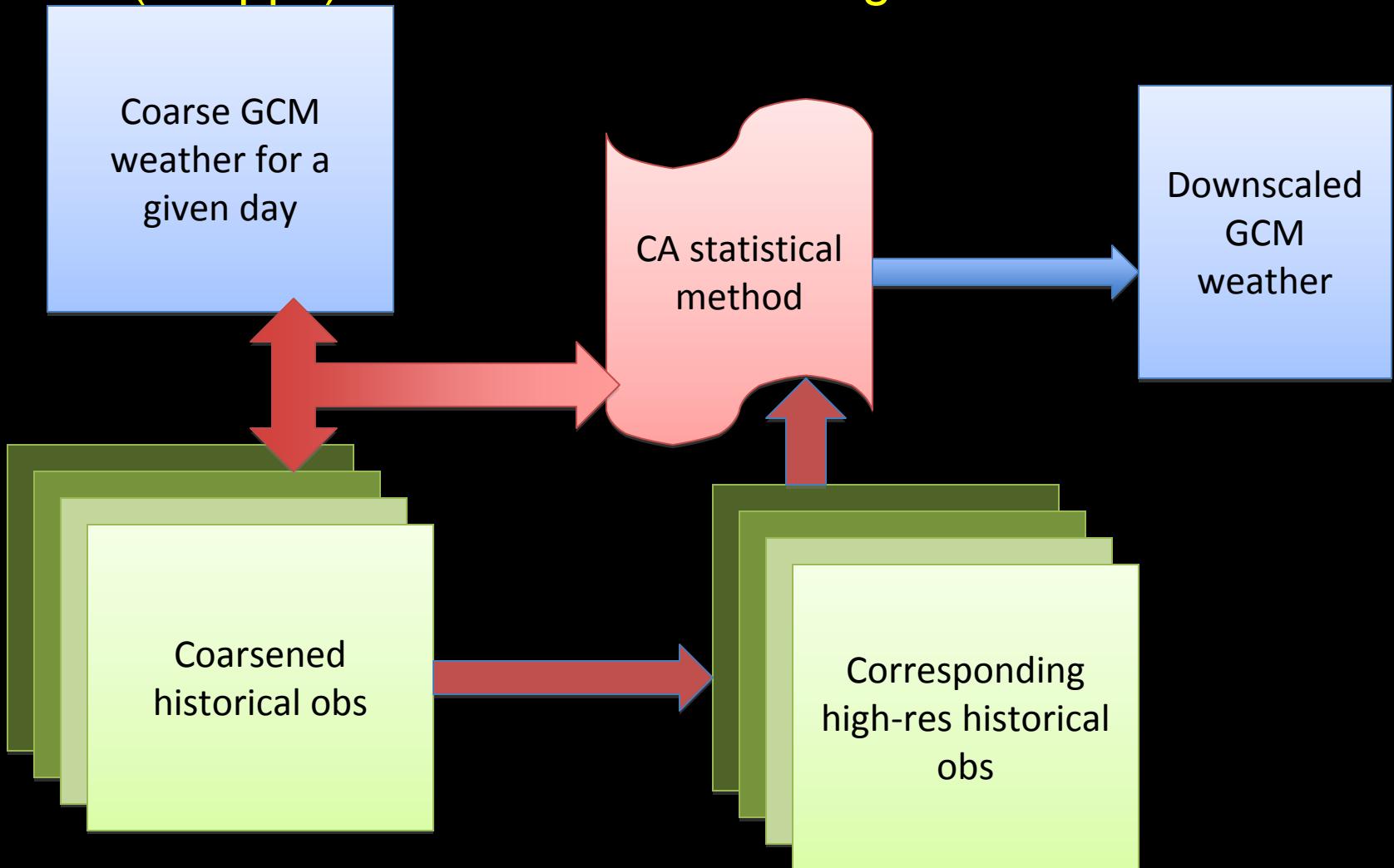
Deterministic Statistical

BCSD (Ed Maurer & U Wash)

Bias-Correction
Spatial Disaggregation Method
(e.g., Maurer et al., HESS, 2010)



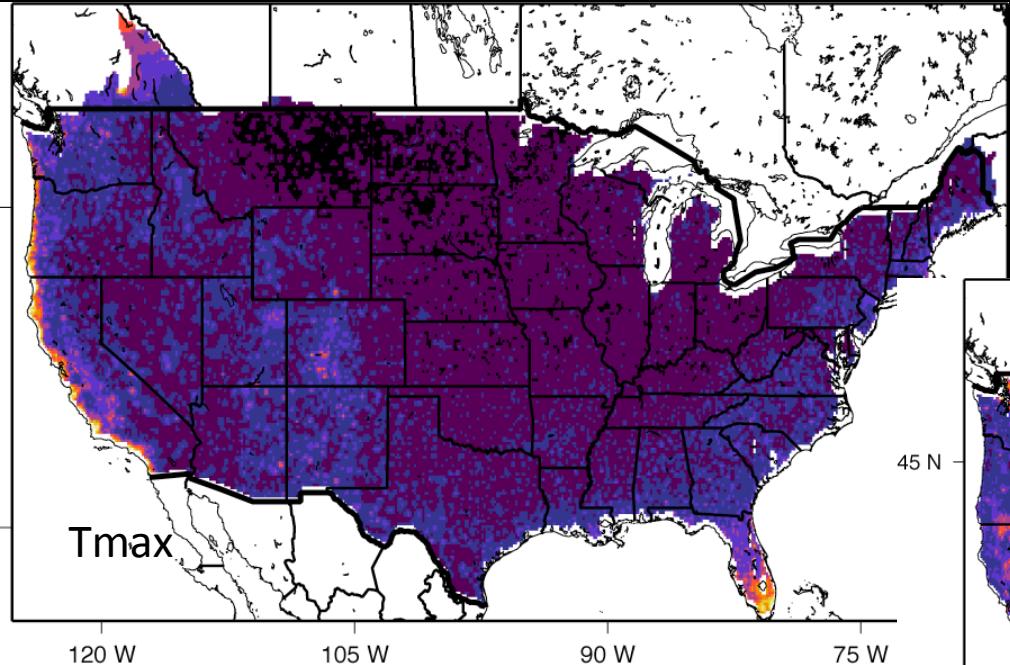
Deterministic statistical CA (Scripps) → Constructed Analogs



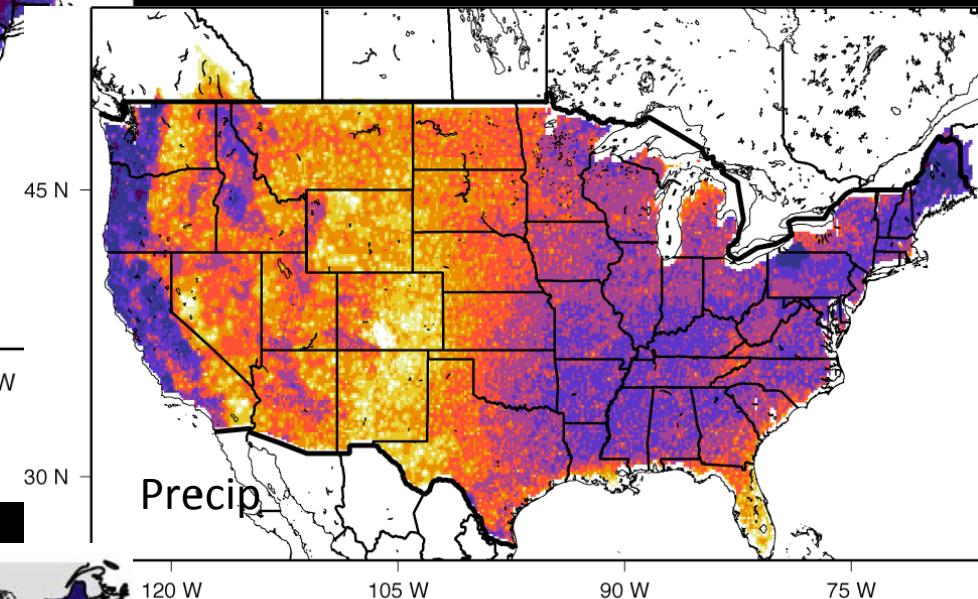
HIDALGO et al 2008:

<http://www.energy.ca.gov/2007publications/CEC-500-2007-123/CEC-500-2007-123.PDF>

Skill of downscaling as indicated by application of method to historical OBSERVATIONS

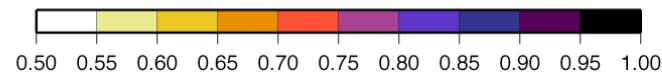
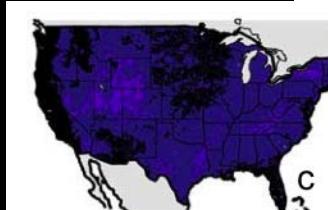


Anomaly Correlations for Daily Tmax's (all years)

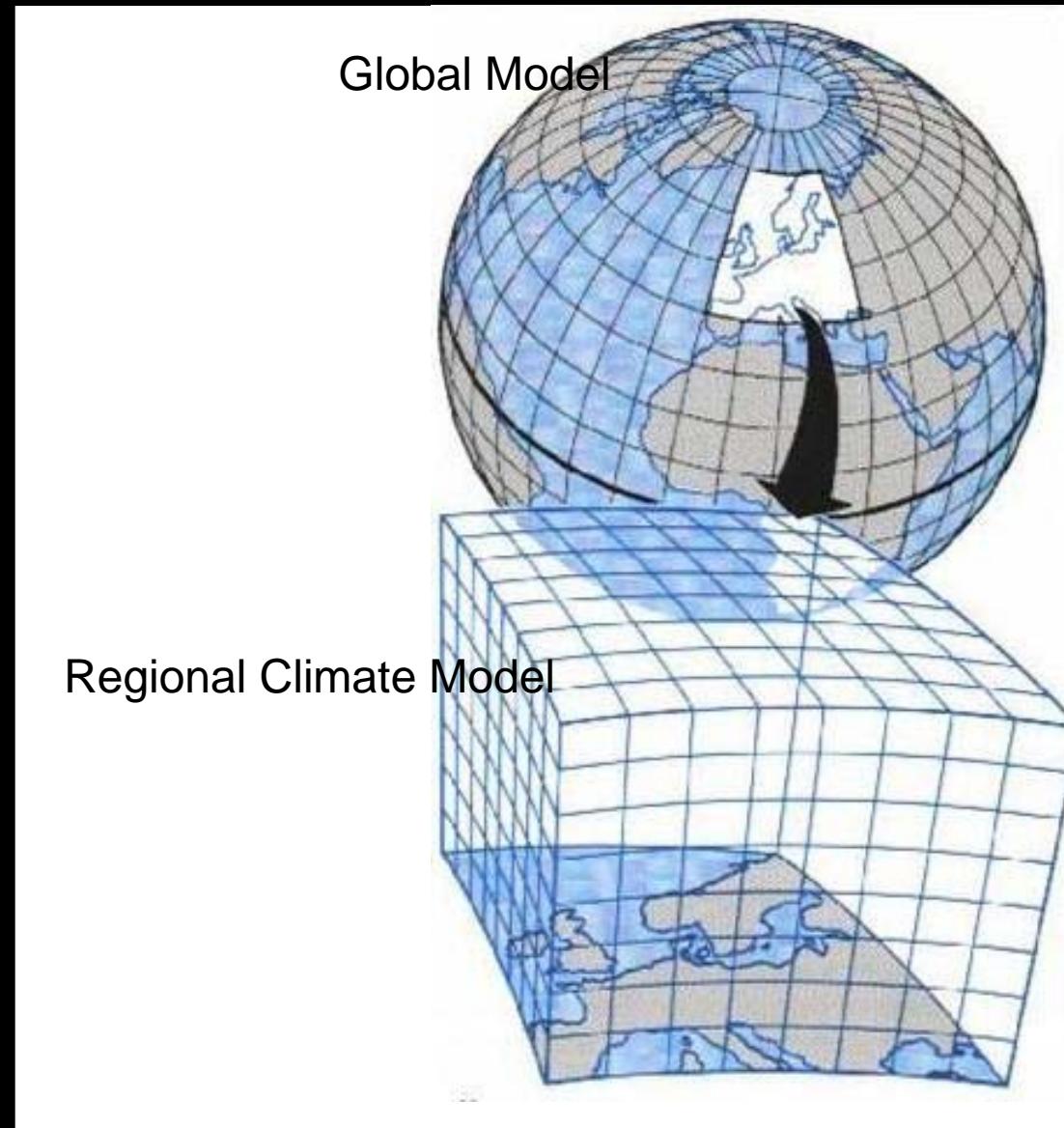


Anomaly Correlations for Daily Root-Precipitation (all years)

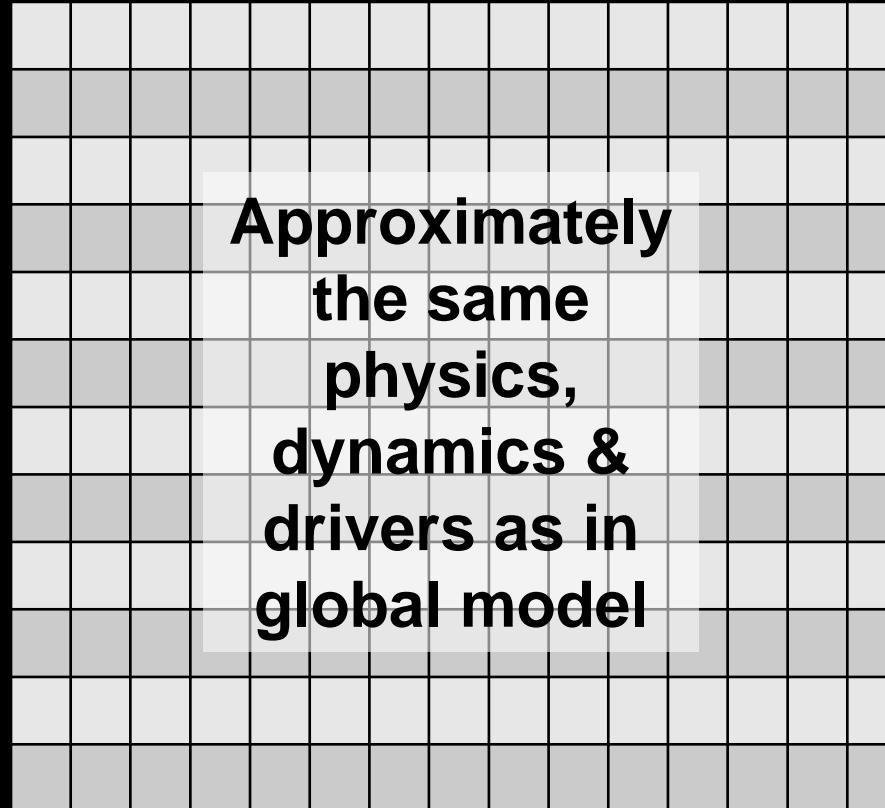
*Precip Skill at
monthly average
scale*



Dynamical simulation for downscaling



*Winds
Temperatures
Vapor
Pressure levels*



*Winds
Temperatures
Vapor
Pressure levels*



*Winds
Temperatures
Vapor
Pressure levels*



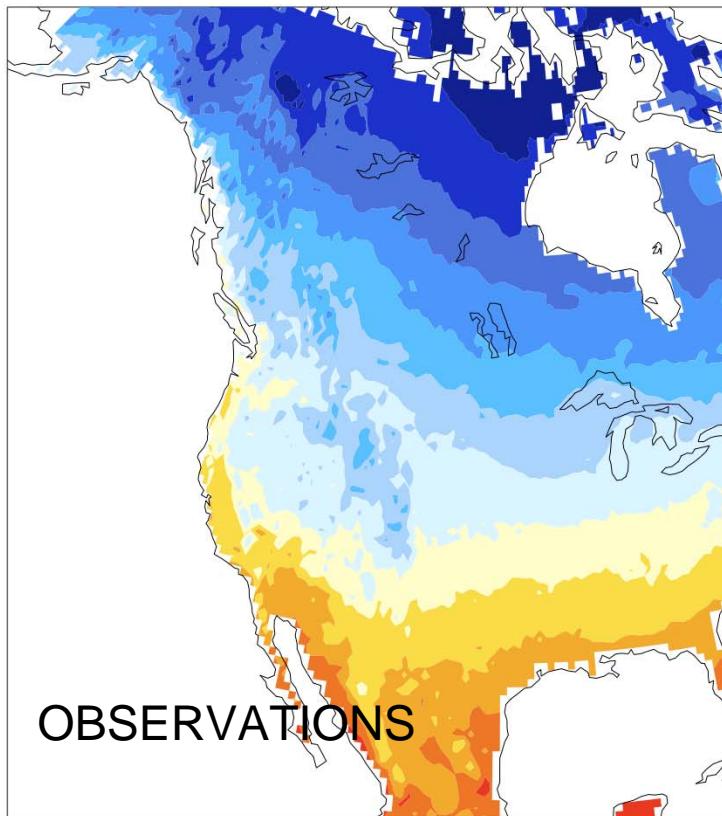
*Winds
Temperatures
Vapor
Pressure levels*



Comparison of Dynamically Downscaled Temperatures to Obs

UDEL obs., DJF seasonal avg,

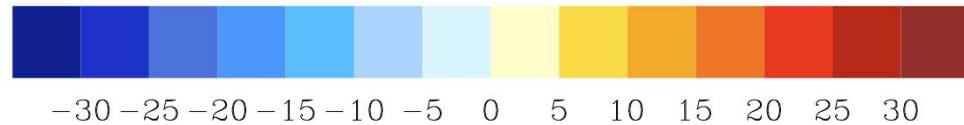
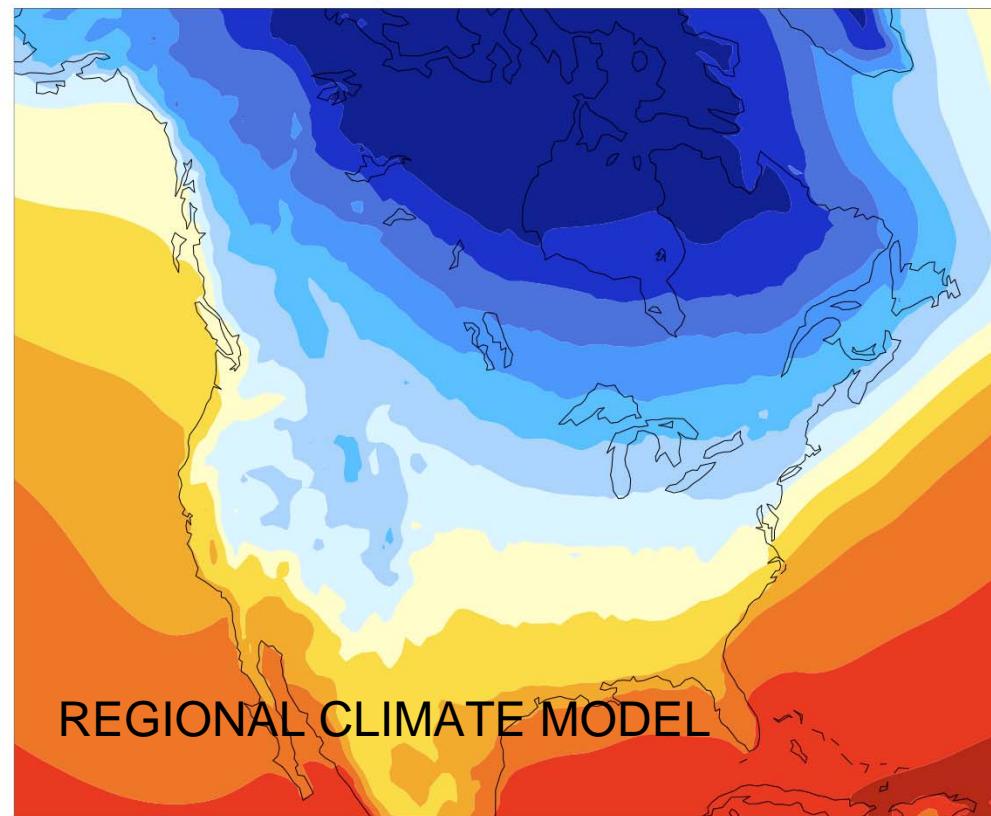
temp



WRFP+NCEP, DJF avg, 1980-2004

Surface Air Temperature

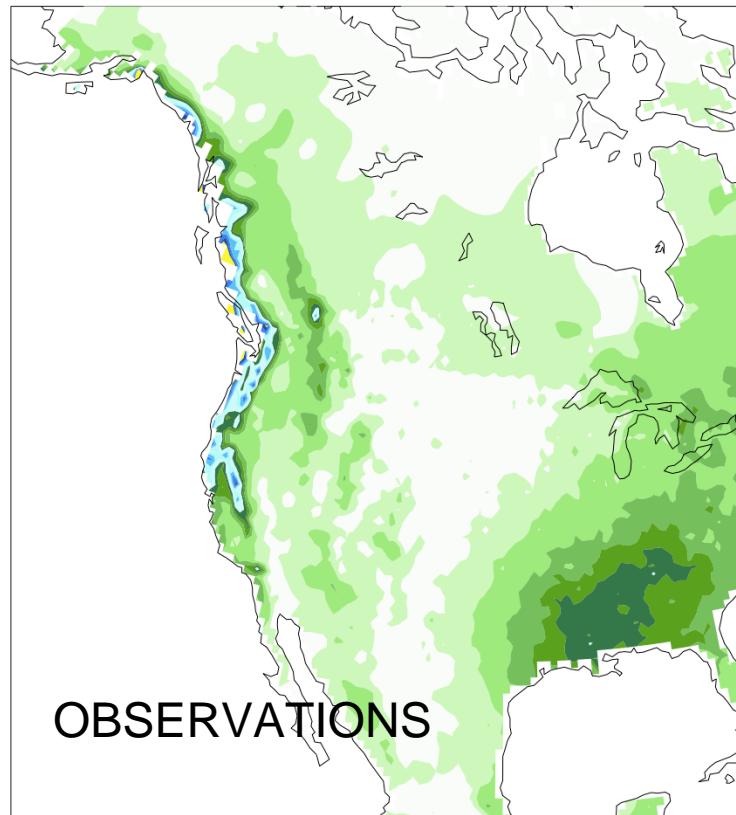
degrees C



Comparison of Dynamically Downscaled Precipitation to Obs

UDEL obs., DJF seasonal avg,

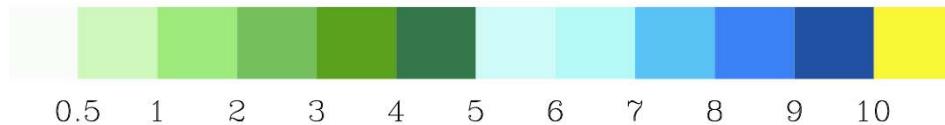
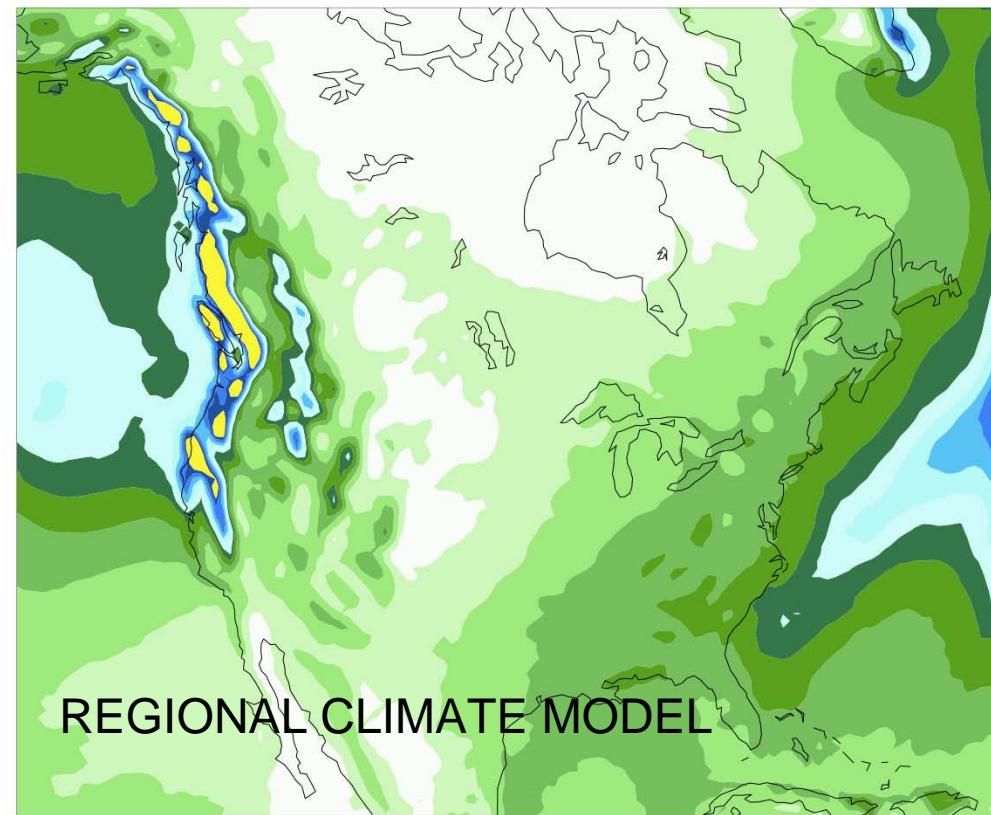
precip



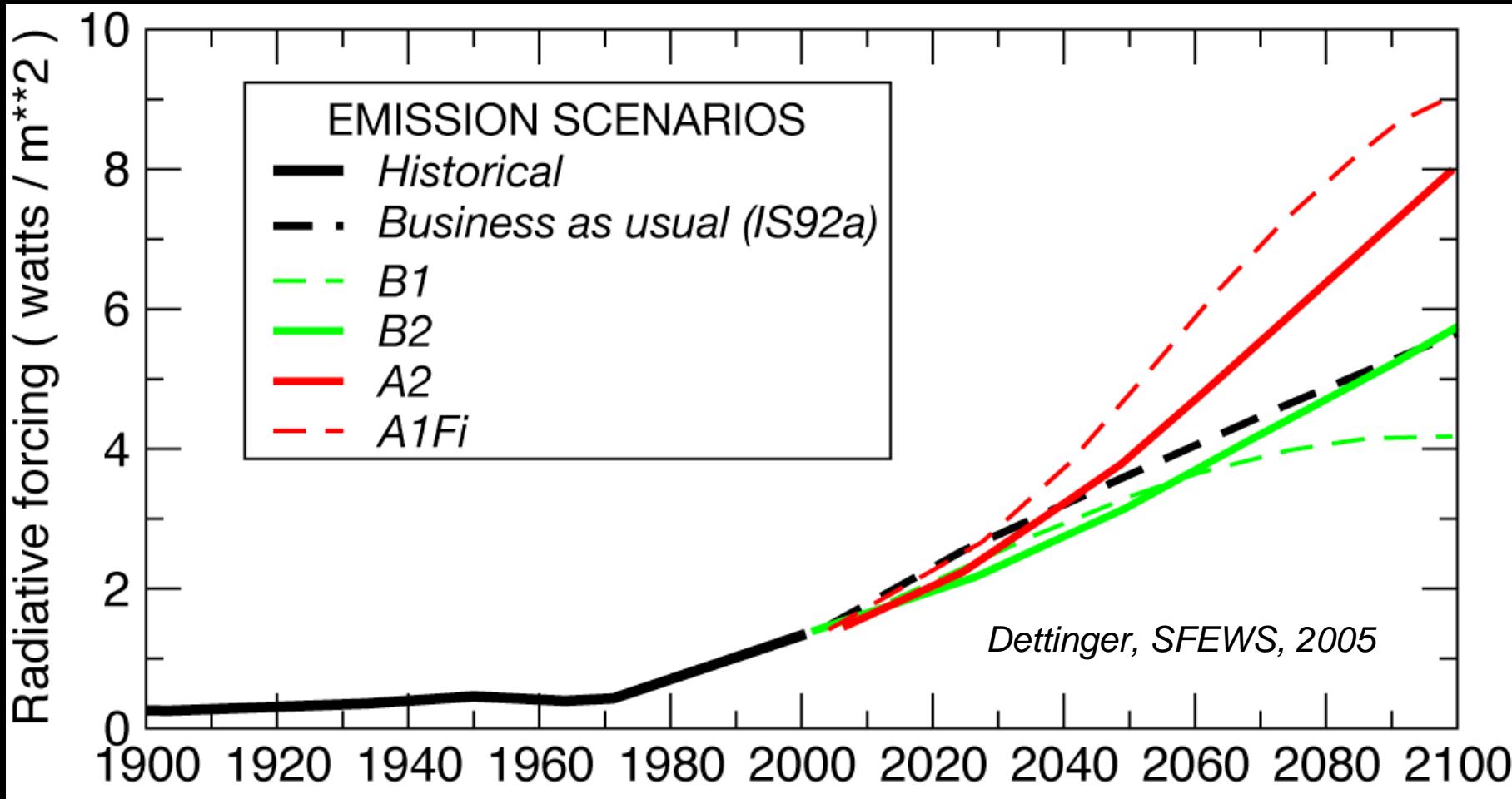
WRFP+NCEP, DJF avg, 1980-2004

Precipitation

mm/day



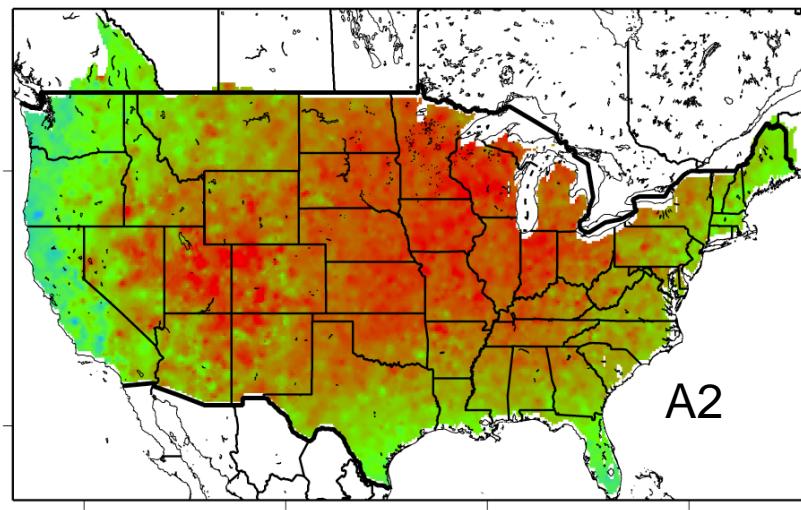
These are the kinds of radiative forcings from scenarios that we all have been evaluating impacts from in recent years (so called, Special Report on Emissions Scenarios, 2000, or SRES scenarios)



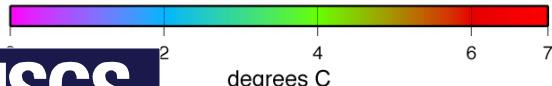
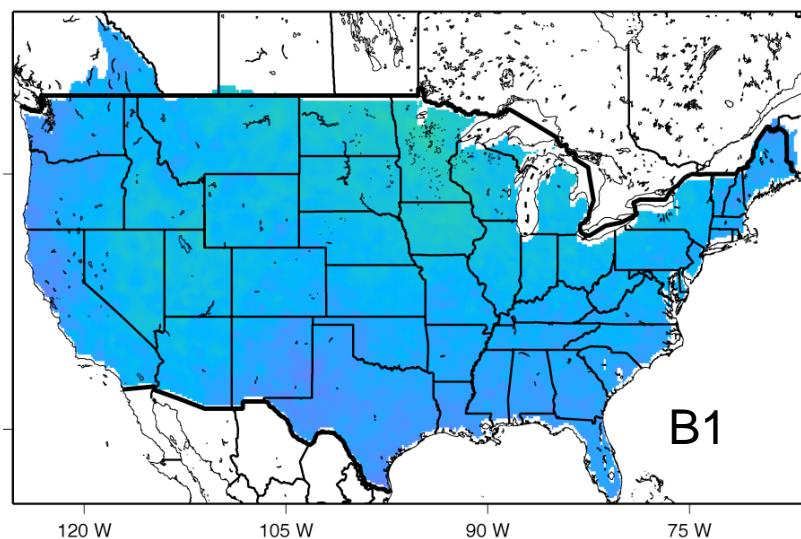
Downscaled GFDL Trends, 2001-2100

A2 Tmin Trends B1 Tmin Trends

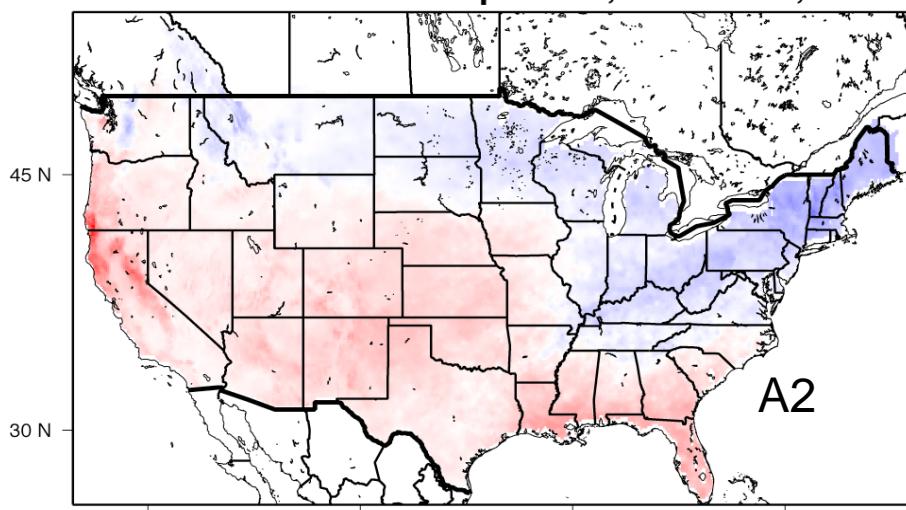
Trends in Annual-Mean Tmin's, 2001-2100, GFDL A2



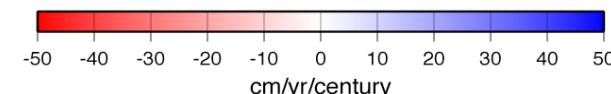
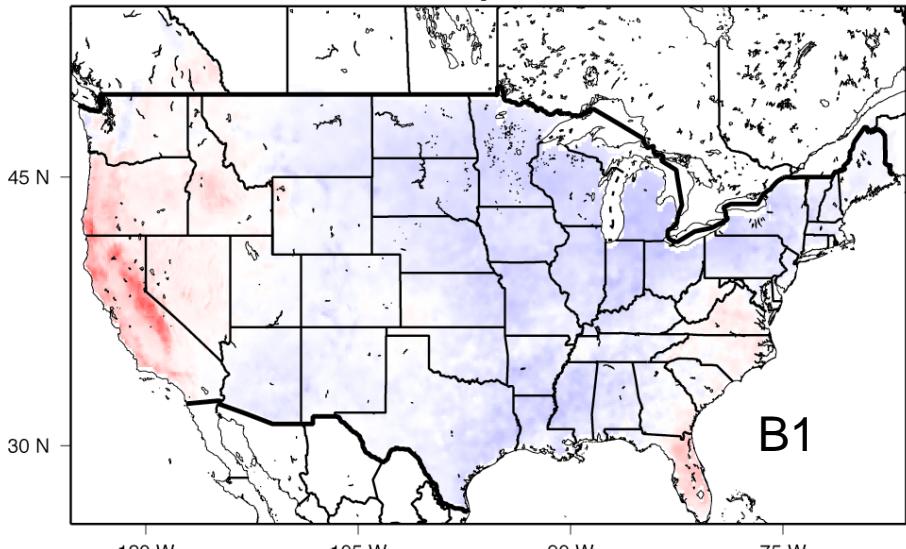
Trends in Annual-Mean Tmin's, 2001-2100, GFDL B1



Trends in Annual-Mean Precipitation, 2001-2100, GFDL A2

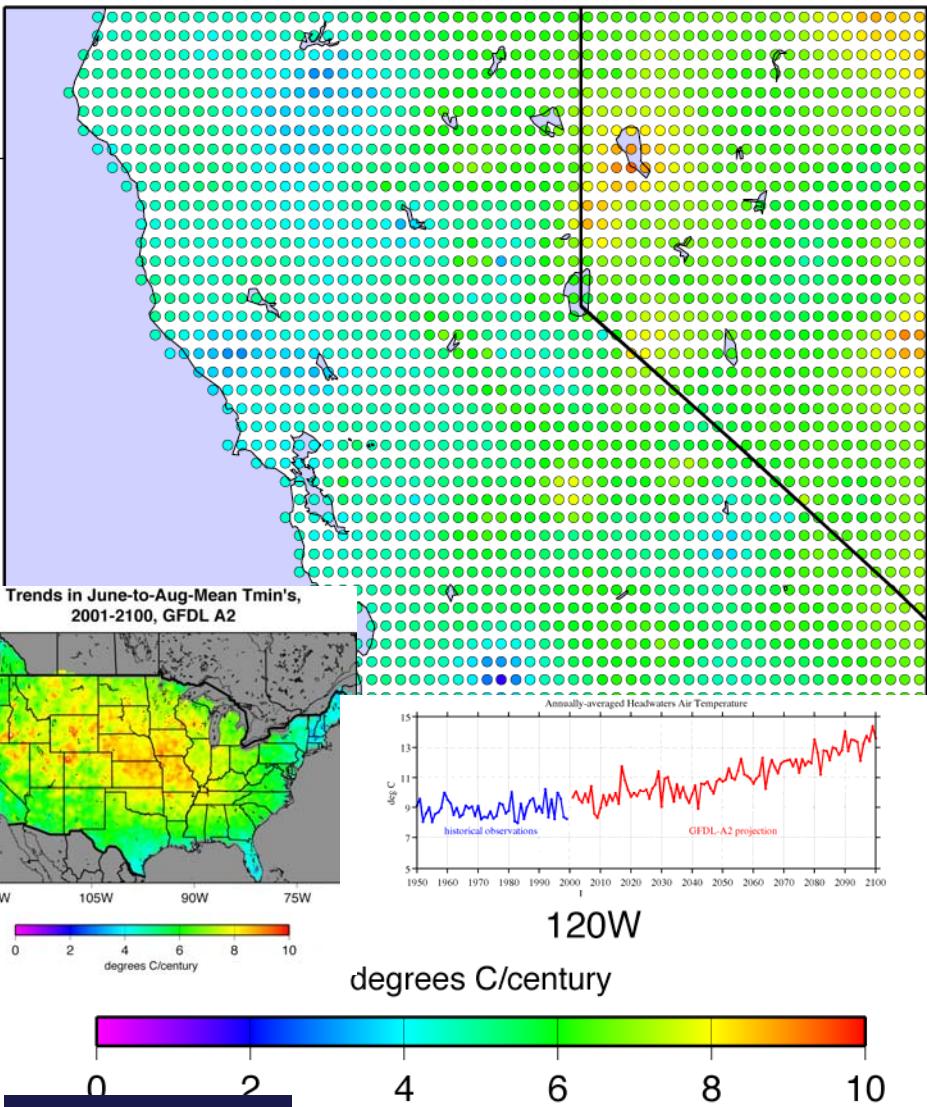


Trends in Annual-Mean Precipitation, 2001-2100, GFDL B1



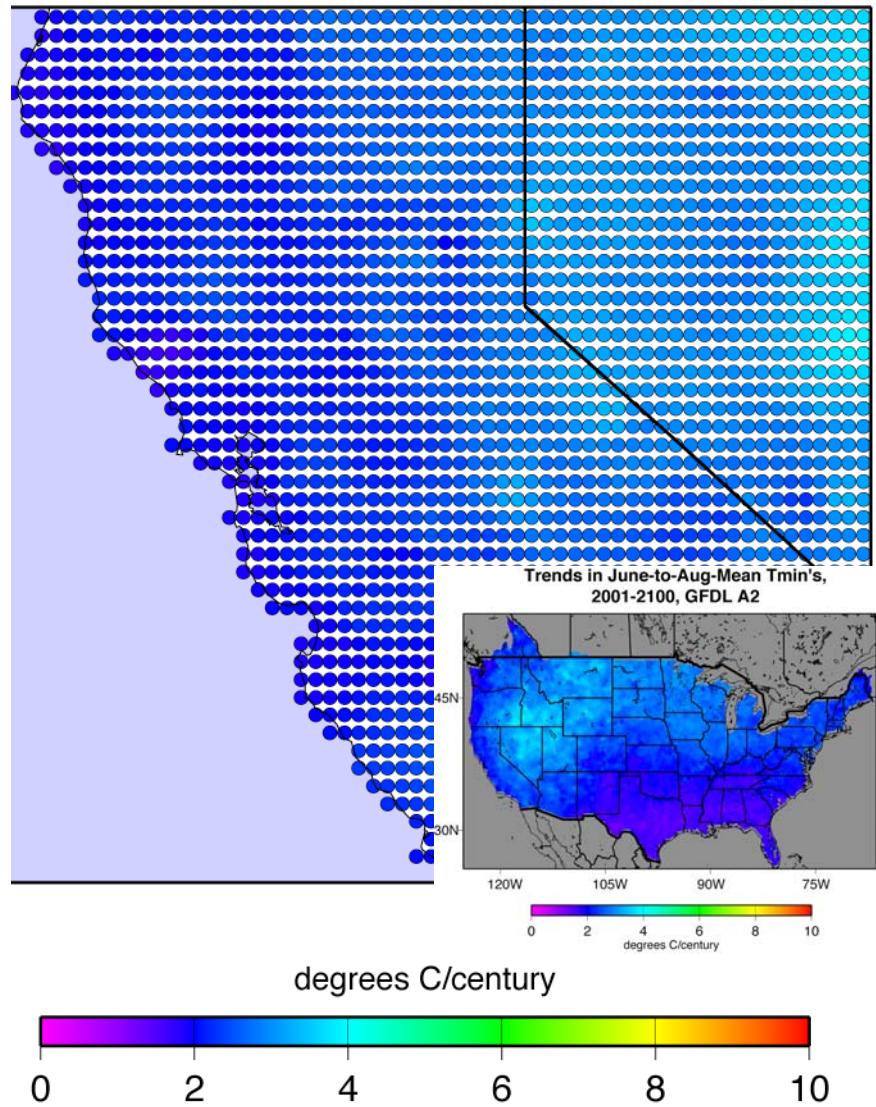
A2 Tmin Trends

Trends in June-to-Aug-Mean Tmin's, 2001-2100, GFDL A2



B1 Tmin Trends

Trends in June-to-Aug-Mean Tmin's, 2001-2100, GFDL B1



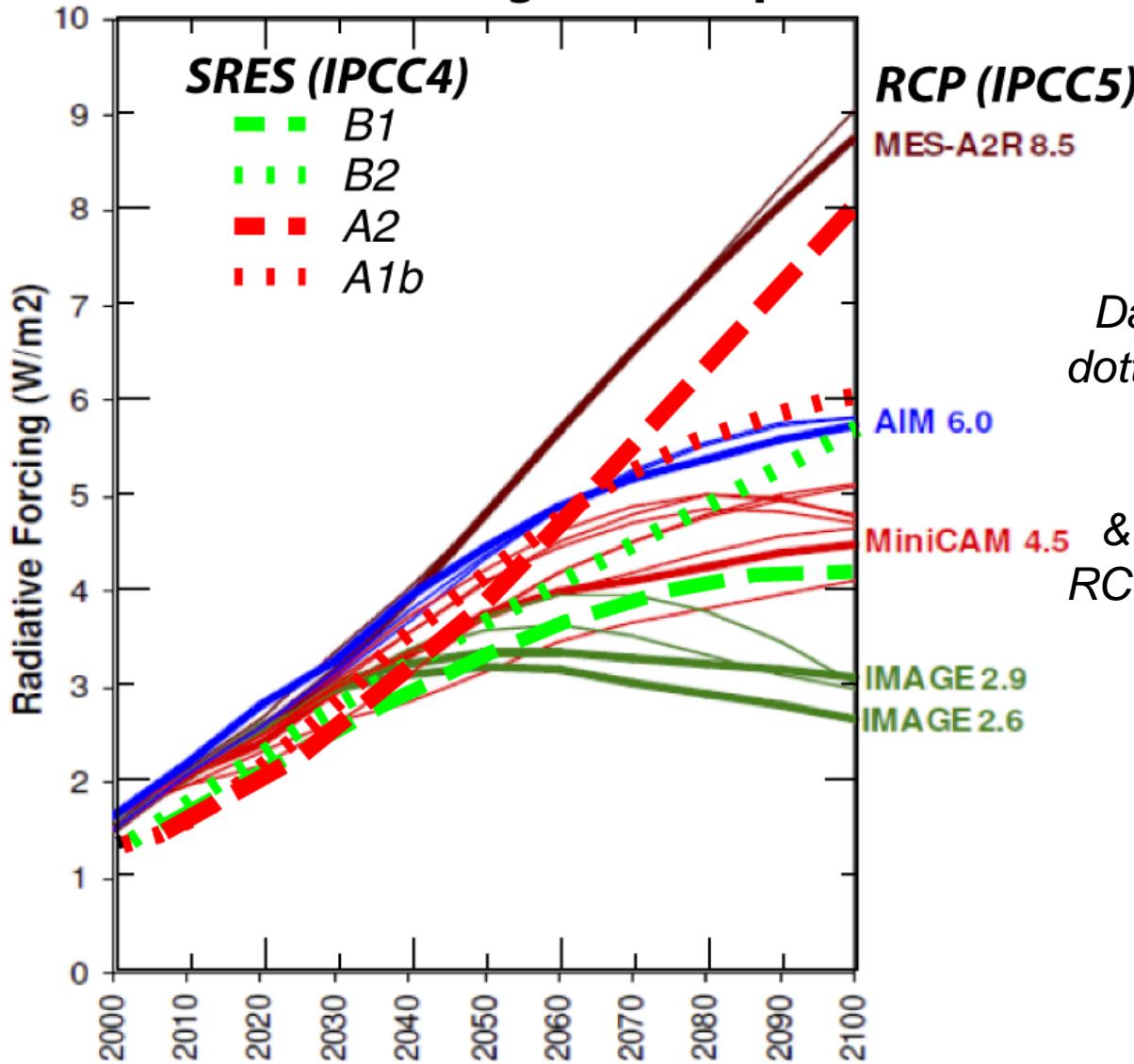
IPCC4 SRES scenarios vs. IPCC AR5 Representative Concentration Pathway (RCP) exemplars

Notice that RCP8.5 is more extreme than A2 and by end of century more like A1Fi (see slide #1)

A1b
“approximates” RCP6.0

B1
“approximates” RCP4.5 at this global-aggregated scale.

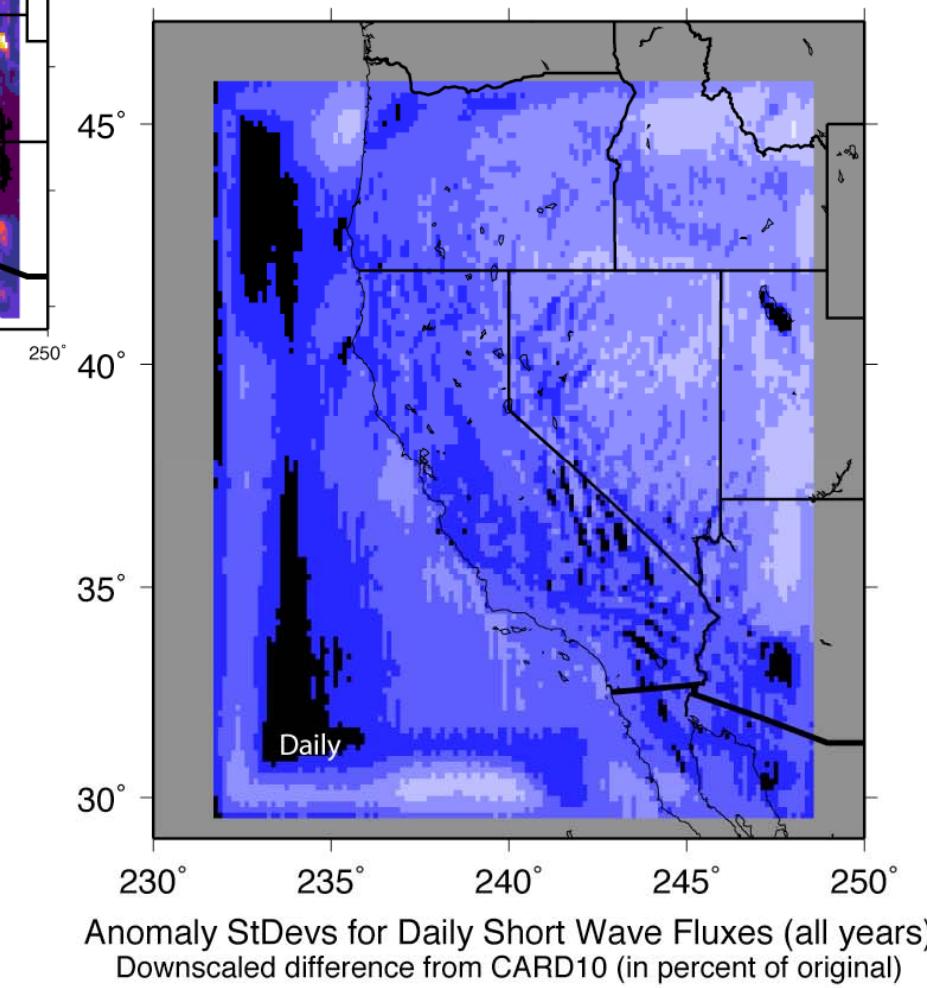
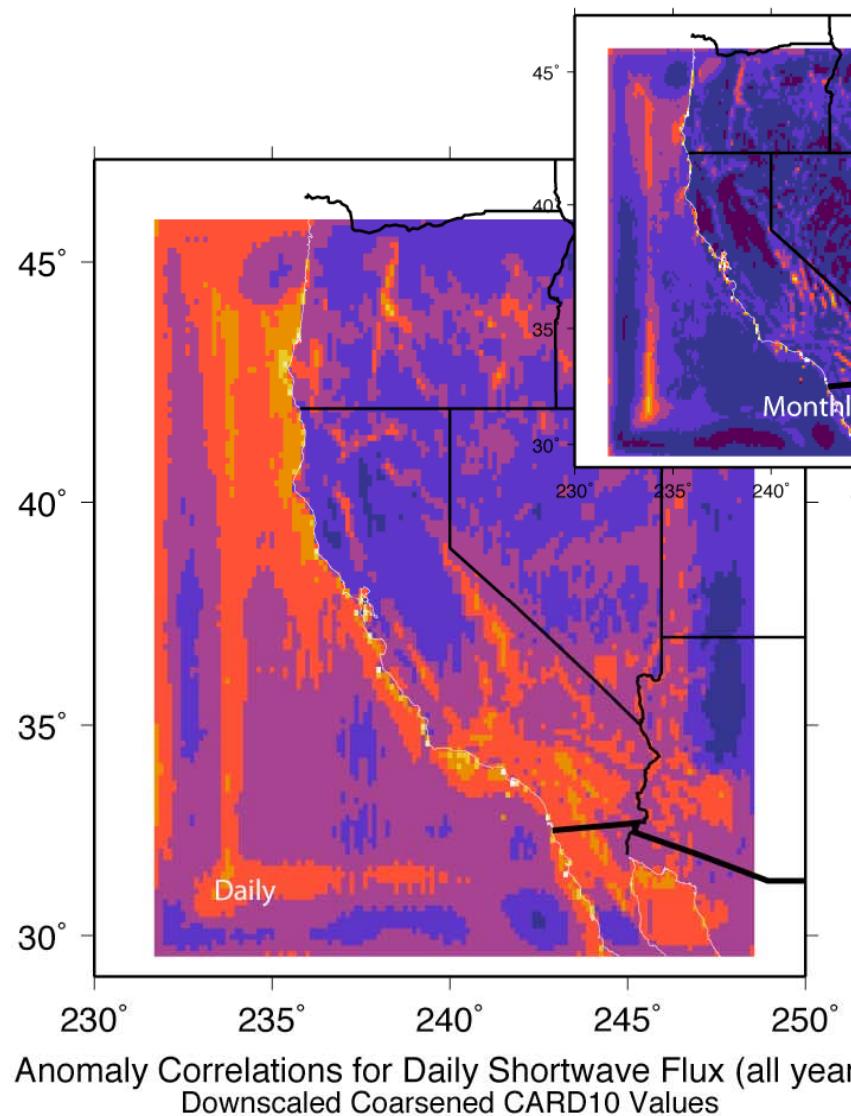
SRES (IPCC4) Forcings overlain on RCP (IPCC5) Forcings for Comparisons



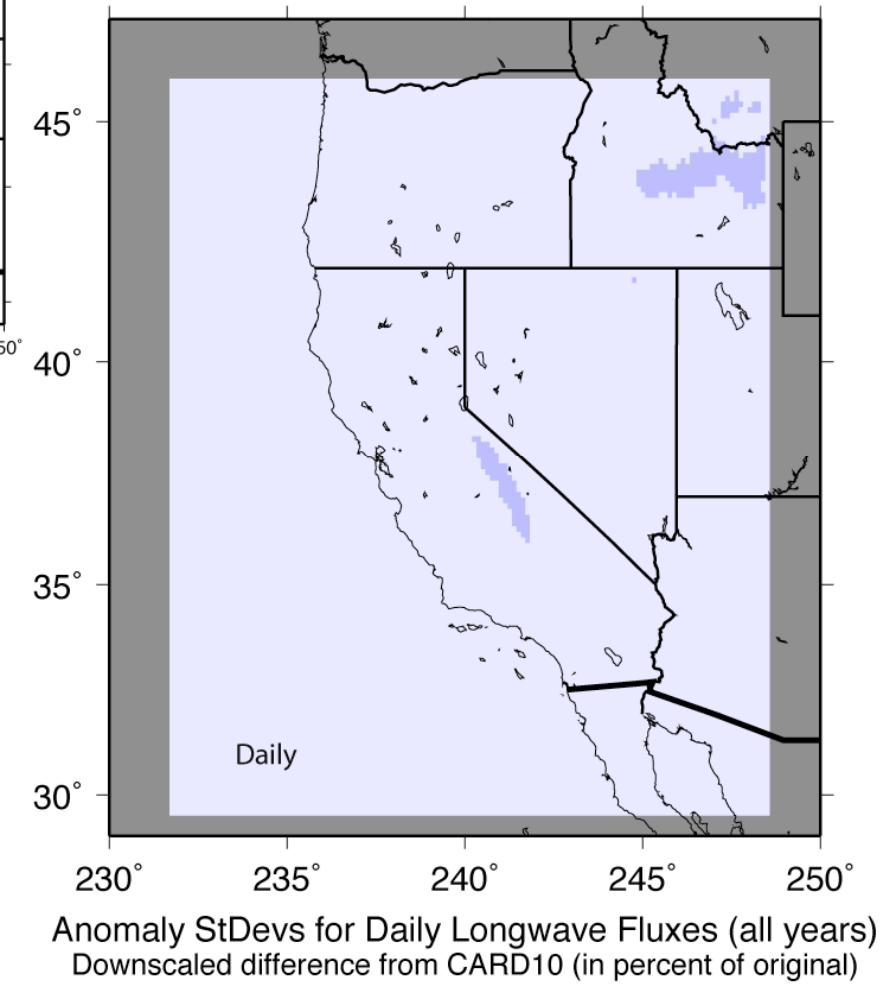
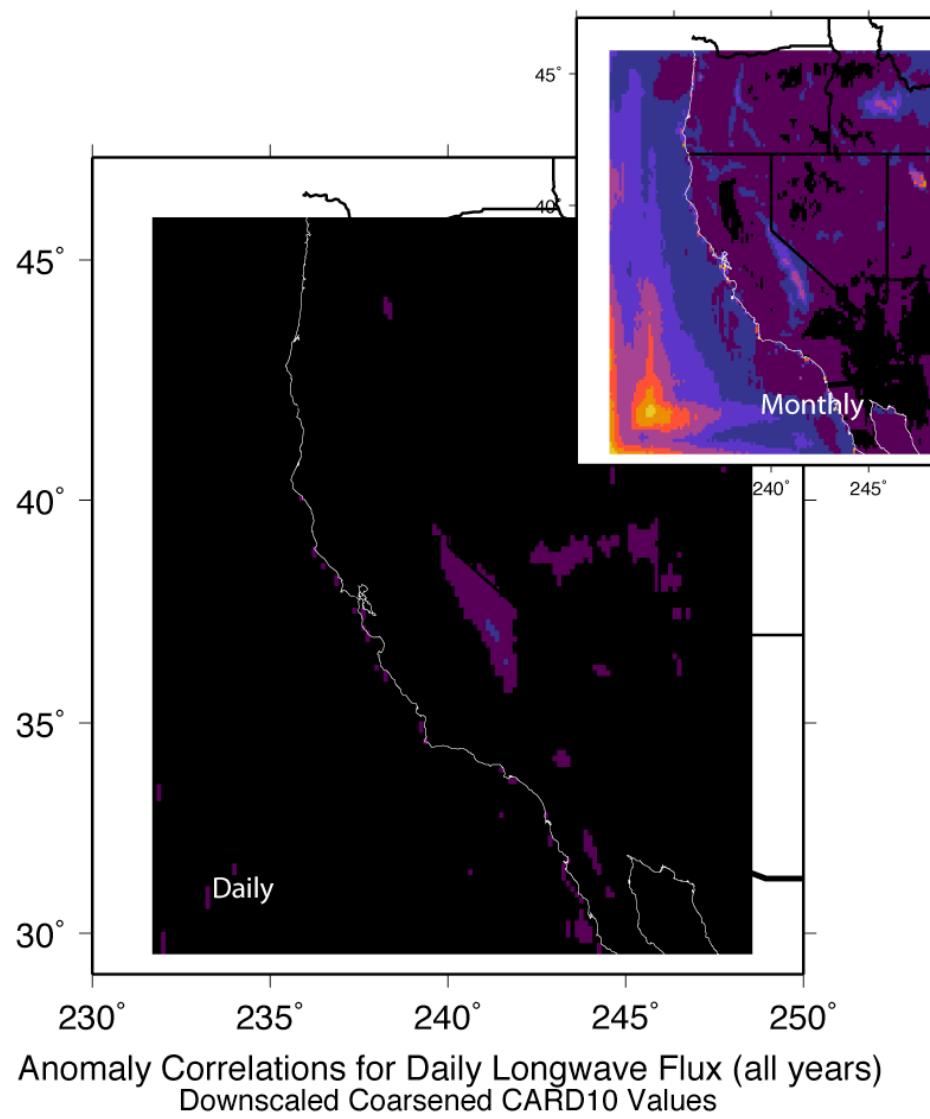
Dashed and dotted curves are SRES (IPCC4) & solids are RCP (IPCC5) scenarios

- Emission levels matter! And new AR5 scenarios are on their way.
- Statistical vs dynamical downscaling options
- Phil Duffy will be laying out available downscaled scenarios.
- We at Scripps have been providing many of the downscaled scenarios for California's Climate Action Team and other State assessment activities in recent years.
- NOTE: Other variables (radiation, winds, etc) can be downscaled; overall modest changes, excepting humidities and longwave radiation

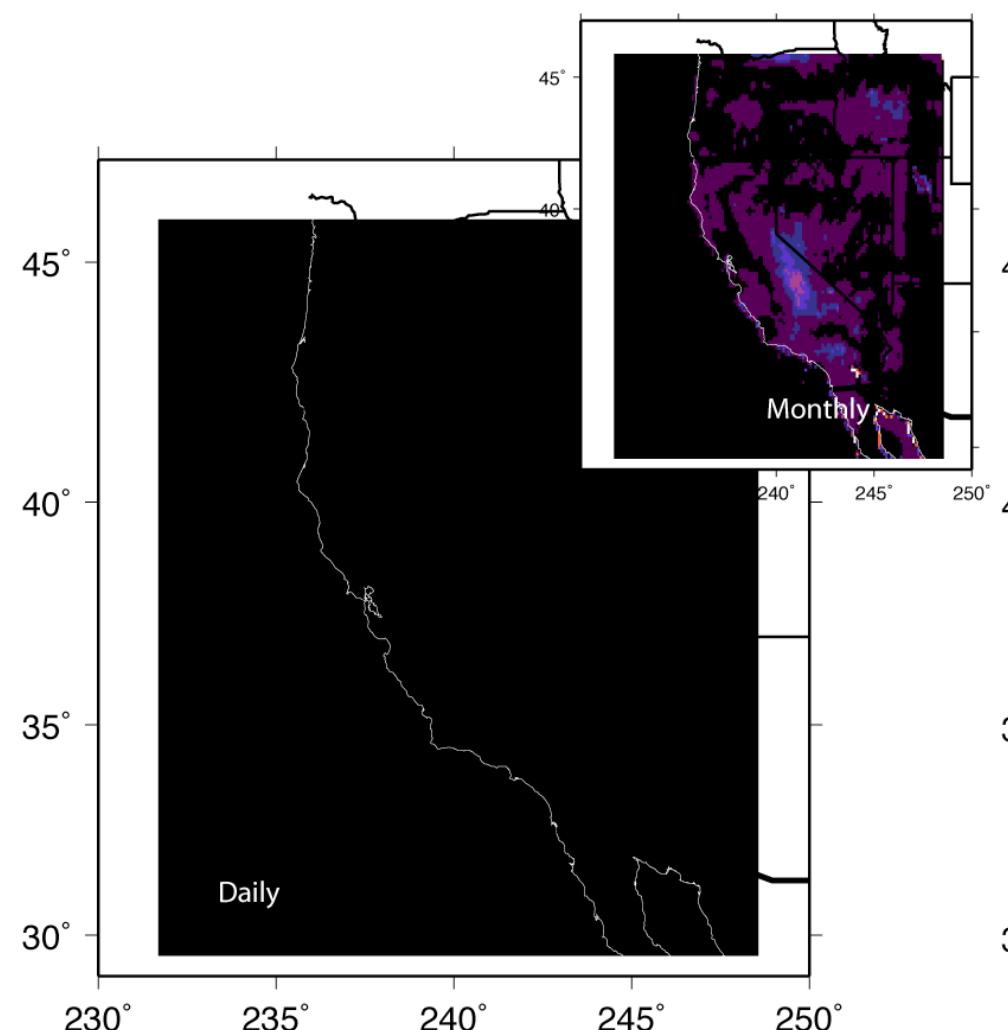
GOODNESS OF FIT OF DOWNSCALED HISTORICAL (1950-99) CARD10 SHORTWAVE FLUXES



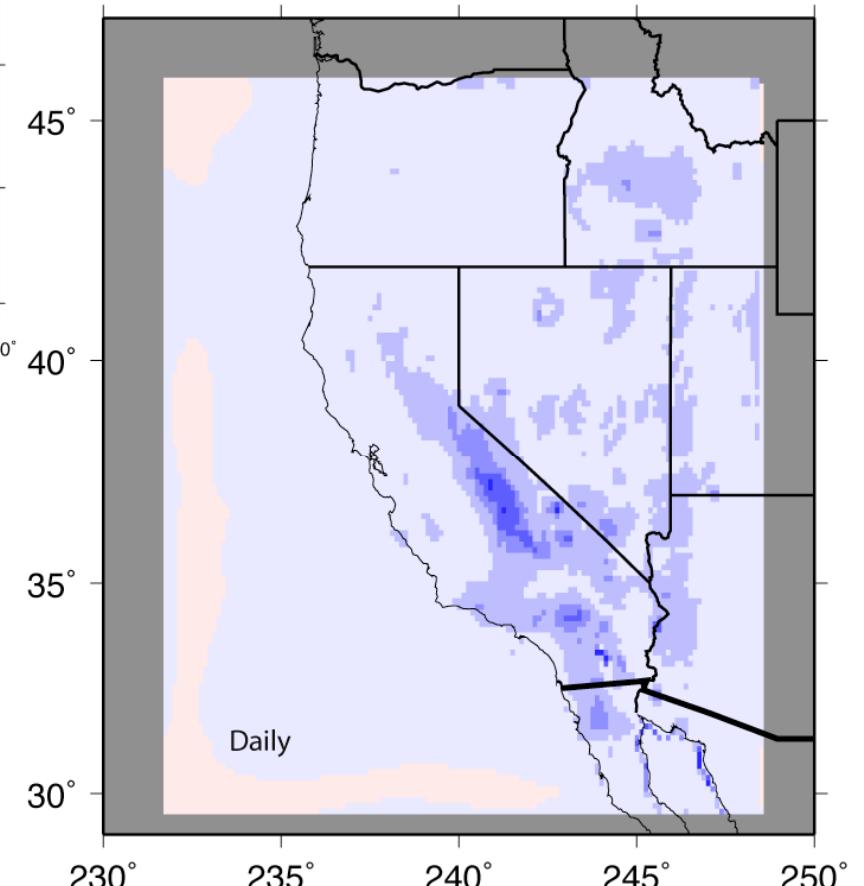
GOODNESS OF FIT OF DOWNSCALED HISTORICAL (1950-99) CARD10 LONGWAVE FLUXES



GOODNESS OF FIT OF DOWNSCALED HISTORICAL (1950-99) CARD10 SPECIFIC HUMIDITY



Anomaly Correlations for Daily Specific Humidity (all years)
Downscaled Coarsened CARD10 Values



Anomaly StDevs for Daily Specific Humidities (all years)
Downscaled difference from CARD10 (in percent of original)

